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# SHERLOCK: Simple Human Experiments Regarding Locally Observed Collective Knowledge

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the conversational agent, and to obtain information via the conversational interface to assist them.

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# SHERLOCK: Simple Human Experiments Regarding Locally Observed Collective Knowledge

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Abstract—We describe the design of human-machine conversation experiments that support the evaluation of our contextaware approach in coalition decision making at or near the network edge. The studies, named SHERLOCK (for Simple Human Experiments Regarding Locally Observed Collective Knowledge), involve humans participating in simple intelligence, surveillance, and reconnaissance (ISR) tasks in physical environments, using mobile devices in situ, or online, Experimental tasks are undertaken by multiple participants operating as a coalition, with collaboration mediated by machine agents. We illustrate the SHERLOCK using two specific experiment designs. In each one, the participants' task is to locate a number of target individuals and identify their specific features. Experiment 1 is a crowdsourcing "whodunit" scenario involving intelligence in synthetic, natural, and hidden situations. All human input is via a conversational agent which mediates information sharing between participants. Experiment 2 is an ISR asset assignment scenario, using simulated sensing assets selected either by a human, via an algorithm, or a combination of the human and machine. Participants' success in both experiments depends on their ability to make effective use of the conversational system, including being able to provide interpretable information to the conversational agent, and to obtain information via the conversational interface to assist them.

## I. INTRODUCTION

Over the past four years we have been researching technologies to support human-machine collaboration in the context of coalition intelligence, surveillance, and reconnaissance (ISR) tasks [1]. We have focussed on approaches using controlled natural language (CNL) to provide representations of information and knowledge that are human readable and writable, as well as machine-processable. Such approaches allow the machine to perform computational reasoning over a knowledge base while expressing rationale that is human-understandable. The overall goal of this research is to use human-machine collaboration to enhance human cognition.

Our recent focus has been on behavioural research to test the effectiveness of the technology for people using simulated ISR tasks. To this end, we have designed a platform for running a series of experiments in which human participants work alone or collectively on gathering synthetic and natural information either in situ or online. Participants address the tasks by interacting with a CNL agent through dialogues in which they can use both natural language (NL) and CNL. The tasks involve the collection of locally observed information, such as simulating activities humans would perform on patrol

or while operating a remote sensing system. However, tasks are simplified to allow participation without any specific ISR training as well as easing some aspects of the natural language processing (NLP) performed by the agent (since NLP is not the focus of our research).

In the experiments, the CNL agent and supporting infrastructure are designed to assist the participants in their tasks. The precise details of what assistance is provided in each case vary from experiment to experiment; generally, tasks involve information collection, sharing, or adding context to local observations to make them more meaningful (i.e., turning information into knowledge). Dependent measures include the time to enter information or make decisions, and their accuracy and/or quality. Our platform is called SHERLOCK (for Simple Human Experiments Regarding Locally Observed Collective Knowledge). <sup>1</sup>

This paper is structured as follows: Section II describes the main elements of the experimental world and participants' tasks. Section III summarises the features of the CNL agent that participants interact with and the assistive capabilities developed in our research. Section IV illustrates the use of the SHERLOCK platform with two example experiments. Finally, Section V concludes and points to future work.

### II. EXPERIMENTAL WORLD

The world of SHERLOCK experiments consists of sets of: persons of interest (POIs), locations, objects, sensors (human and machine), and attributes of all of these entities. Participants are provided with a subset of information about the world, for example, a map of locations, "mugshots" of POIs, and a list of attributes of interest. Their task is to collect specific information, for example, to discover the location of POIs and the values for their particular attributes, or just to collect as much information as possible. The world is modelled in CNL, making it relatively straightforward to define sets of instances for a particular experiment setup.

Worlds have information that is synthetic, natural, or some combination of both. For example, human actors may portray fictional POIs inhabiting real-world locations, or cartoon characters may inhabit synthetic virtual locations. Participants

<sup>1</sup>The name was chosen to give participants a sense that their tasks involve elements of detection and deduction.

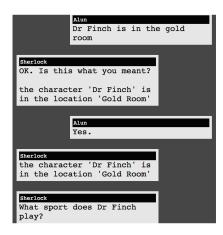


Fig. 1. The CNL agent used in a SHERLOCK game

may be tasked to report on natural real-world objects or distinctive objects placed in locations for the purposes of creating artificial scenes. Given that our research focus is not on NLP, synthetic elements are often easier for participants to describe to the agent (with lower complexity and potential for ambiguity). For example, it is easier to describe the location of an object in cases where that location has a label, such as a room number, than it is to describe an "unlabelled" location, such as a corridor or public space. Highly distinctive objects, such as pieces of fruit or sporting equipment, are also relatively easy to describe.

### III. CNL AGENT CAPABILITIES

A full description of the capabilities that are the focus of our research is given in [2]. The core capability is a conversational agent that supports a set of interactions defined in a protocol, including interactions to verify machine-generated mappings of NL to CNL (confirm), question-answer interactions (ask/tell), imparting of information (tell), and obtaining rationale for some piece of machine-generated information (why). Figure 1 shows a screenshot from one of the mobile apps created for a SHERLOCK experiment. The conversation between the user ("Alun") and the agent ("Sherlock") is displayed as a conventional text "chat" thread. The user's input is in NL, which the agent maps to CNL via NLP. The user can either confirm that the CNL is an acceptable interpretation of his or her input (shown as the "Yes" message here) or reject the agent's interpretation and try again. The agent can also ask the user questions, as shown in the bottommost message.

### IV. EXAMPLE EXPERIMENT DESIGNS

**Design 1: "Whodunit".** This design features six POIs played by human actors. Participants are assigned a set of 54 questions in total, mostly concerning (fixed) attributes of the six characters. Values for the attributes — including a character's location, shirt colour, preferred fruit, and hobby — are discoverable by visiting a set of locations around a university building. In addition, a subset of the 54 questions requires participants to locate real-world objects in the vicinity of the given locations (e.g., works of art and historical

artefacts). Participants gain points for submitting answers to questions and for reporting other real-world objects in the environment (including both "mundane" items, such as furniture and office equipment, and a number of "anomalous" objects, such as balloons and toys that would not normally be found in a university building). The CNL agent mediates the collection of information as a crowdsourcing exercise. Each participant has access to a shared dashboard where questions are considered "settled" once a sufficient number of consistent answers has been received. Different groups of participants can be equipped with different variants of the CNL agent (e.g., a version supporting only confirmatory and tell interactions, and a version that also supports ask/tell querying, allowing participants to access other players' submitted information). Gradually, as information is acquired, participants can uncover a "crime" committed by one of the POIs against another.

**Design 2: ISR asset assignment.** In this design, POIs can move between locations. Participants can only view locations via simulated sensing assets (e.g., colour or B&W cameras). The participants' goal is to locate the POIs (and maintain current location information) and report on visible attributes of the POIs (e.g., carried objects, shirt colour). Participants can work alone or in a coalition team with sharing of assets and information. The agent capabilities vary in terms of the degree of intelligent and predictive assistance given to participants in terms of asset selection, using state-of-the-art algorithms [3].

### V. CONCLUSION

Initial results from SHERLOCK experiments, currently being written for publication, indicate that untrained users can quickly become productive with the CNL agent, allowing them to cooperate effectively with other "coalition members". So far, approximately 45 people (undergraduate students and industry researchers) have participated in SHERLOCK experiments. Further experiments will be run through April 2016.

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